

# Quantum Lego

Quantum Codes and their Enumerators from Tensor Networks

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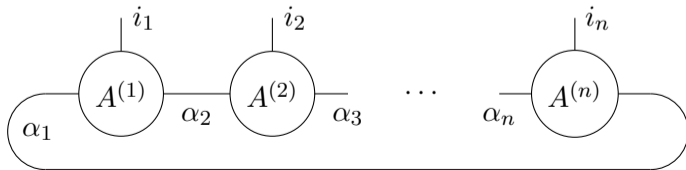
# Matrix product states and tensor networks

Tensors are just quantum states  $|T\rangle = \sum_{i_1, i_2, \dots, i_n} T_{i_1 i_2 \dots i_n} |i_1 i_2 \dots i_n\rangle$ .

- Tensor networks are a way to construct states from lower dimensional ones.
- For example a matrix product state is of the form

$$|T\rangle = \sum_{i_1, i_2, \dots, i_n} \sum_{\alpha_1, \alpha_2, \dots, \alpha_n} (A^{(1)})_{i_1, \alpha_2}^{\alpha_1} (A^{(2)})_{i_2, \alpha_3}^{\alpha_2} \dots (A^{(n)})_{i_n, \alpha_1}^{\alpha_n} |i_1 i_2 \dots i_n\rangle.$$

- Each matrix is viewed as a tensor itself  $|A^{(j)}\rangle = \sum_{i_j, \alpha_j, \alpha_{j+1}} (A^{(j)})_{i_j, \alpha_{j+1}}^{\alpha_j} |i_j, \alpha_j, \alpha_{j+1}\rangle$ .
- The “ $\alpha$ -legs” get traced when forming  $|T\rangle$  while the “ $i$ -legs” do not.



# Quantum codes from tensor networks

For simplicity define a  $[[n, k]]_q$  quantum code as a mapping  $V : \mathfrak{H}_q^{\otimes k} \rightarrow \mathfrak{H}_q^{\otimes n}$ , where  $\mathfrak{H}_q = \mathbb{C}^q$ . One can convert it to a rank  $n + k$  tensor  $V_{i_1, \dots, i_{n+k}}$  over a basis

$$V = \sum_{i_j} V_{i_1 \dots i_{n+k}} |i_{k+1}, \dots, i_{k+n}\rangle \langle i_1 \dots, i_k|. \quad (1)$$

Quantum lego is about building large codes from small.

- Codes are traced like tensors in a network, yielding new codes.
- The check matrix of new code is easily obtained from those of the smaller codes.
- Logical operations are easily analyzed through “operator pushing.”

Yet, it is unclear how to obtain the distance of the new code from the smaller ones.

- *Goal:* show the enumerator of the trace is the trace of the enumerators!

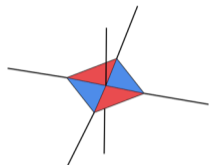


# A small example: the $2 \times 2$ Bacon-Shor code

Today we will work extensively with the  $2 \times 2$  Bacon-Shor code.

We view it as a  $[[4, 2]]$  code with stabilizer  $\mathcal{S} = \langle XXXX, ZZZZ \rangle$ .

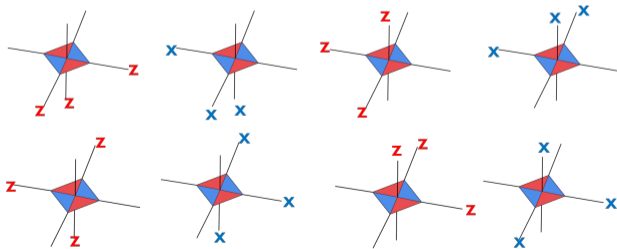
- The four physical qubits are the horizontal legs in the plane.
- The logical qubit is the upward pointing leg.
- The gauge qubit is the downward pointing leg.



Operations on gauge and logical qubits are seen as tensor stabilizers.

For example, on the far left:

$$\begin{aligned} \overline{Z} &= ZIIZ = IZZI \\ \overline{X} &= XXII = IIXX. \end{aligned}$$

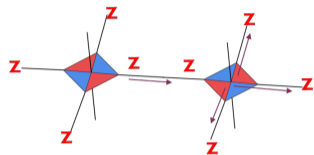


# Operator pushing

Tracing can be analyzed via “operator pushing.”

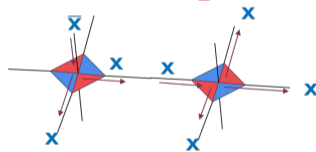
*Top:*  $ZZZZZZ$  is stabilizer for the traced code.

- Starting on the left, we push a  $Z$  through the trace.
- We use a stabilizer to push this  $Z$  to the boundary.



*Bottom:* we find a representation of a  $\bar{X}$  operator.

- We use the local representation of  $\bar{X}$ .
- We push the  $X$  through the trace,
- Finally use a stabilizer to push  $X$  to the boundary.



These rules can be formalized into a simple rule for manipulating check matrices.

In this example, the traced code is the  $[[6, 4, 2]]$  code with  $\mathcal{S} = \langle XXXXXX, ZZZZZZ \rangle$ .

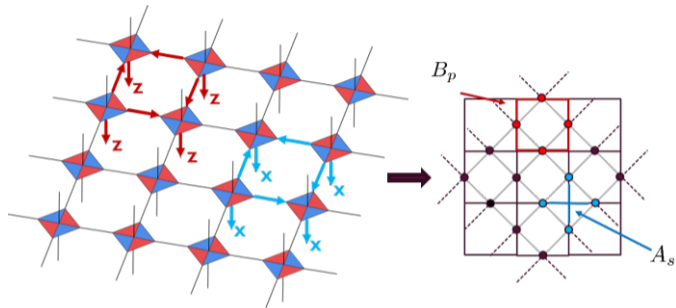


# Constructing topological codes

Here we see a surface code.

Two sets of gauge operators (pointing downward) each push to the identity.

These define relations on these qubits that may be identified as stabilizers of the surface code.

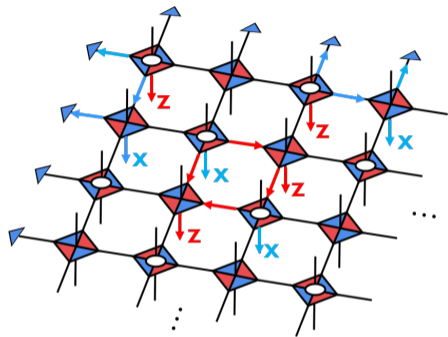


We obtain the toric code by tracing corresponding legs on opposite boundaries.

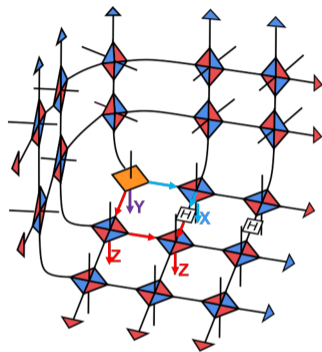
- Note that the gauge qubits of the legs are now the physical qubits of the code.
- The logical qubits (pointing upwards) have similar relations we have not shown; these form the logical qubits of the code, which are not localized to single legs.



## Variants on surface codes



The XZZX-code<sup>1</sup> is recovered with a similar network. Alternating legs have a  $H$  applied to the gauge legs.



The triangle code<sup>2</sup> twists the surface code with a  $[[4, 1]]$  gadget. Note additional  $H$ s are traced into some legs.

<sup>1</sup>Kay, *PRL* **107**(27):270502, 2011

<sup>2</sup>Yoder and Kim, *Quantum* **1** (2017): 2.





# Constructing color codes

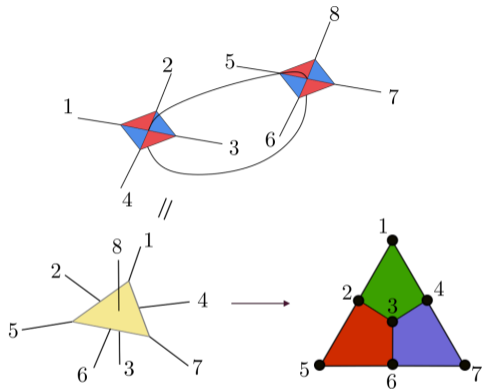
Here we build a simple color code: the Steane code.

Again we trace two  $2 \times 2$  Bacon Shor codes, but now we trace the corresponding logical and gauge qubit legs.

The resulting traced codes is symmetric: we just identify one of the legs as logical (labeled 8 here).

This example illustrates how logical operators and stabilizers intermix in the post-traced code.

- For example:  $XXXXIIII$  is a stabilizer both for one lego and the traced code.
- However,  $IIIIXXXX$  is a stabilizer of one lego, but defines a logical operator on the traced code.



# Atomic Legos

One can show every quantum code can be constructed from three types of legos:

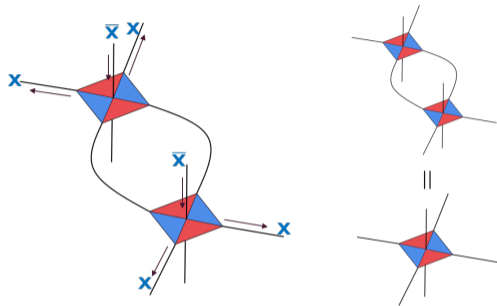
- A one-qubit state, say  $|0\rangle$ .
- One qubit unitaries.
- The *GHZ* state  $\frac{1}{\sqrt{2}}(|000\rangle + |111\rangle)$ .

Yet, we know of no bounds on how many of these atomic legos will be needed.

For example, in double traced codes shown here, we seem to have a logical operation.

- However these cancel if we push the logical operators on the traced legs.
- Hence  $\overline{XX}$  is a relation, and  $XXXX$  is a stabilizer of the post-traced code.

In fact, the post-traced code is again the  $2 \times 2$  Bacon-Shor code.



# Quantum weight distributions

## Definition [Shor-Laflamme<sup>3</sup>]

Let  $\mathcal{E}$  be an error basis on a Hilbert space  $\mathfrak{H}$ , and  $M_1, M_2$  Hermitian operators on  $\mathfrak{H}$  (in practice  $M_1 = M_2 = \Pi_{\mathcal{C}}$ ). Then their *quantum weight distributions* are

$$A_d(M_1, M_2) = \sum_{E \in \mathcal{E}^n[d]} \text{Tr}(E^\dagger M_1) \text{Tr}(EM_2),$$

$$B_d(M_1, M_2) = \sum_{E \in \mathcal{E}^n[d]} \text{Tr}(E^\dagger M_1 EM_2).$$

Here  $\mathcal{E}^n[d] = \{E_1 \otimes \cdots \otimes E_n : \#\{E_j \neq I\} = d\}$  (e.g.  $n$ -qubit Paulis of Hamming weight  $d$ ).

- $B_d$  is the quantum analogue of the usual weight distribution of a code,
- $A_d$  is the quantum analogue of the weight distribution of its dual code.

<sup>3</sup>Shor and Laflamme, *PRL* **78**(8):1600, 1997.



# Quantum weight enumerators

We package up these distributions as polynomials, or enumerators:

$$A(z; M_1, M_2) = \sum_{d=0}^n A_d(M_1, M_2) z^d, \quad B(z; M_1, M_2) = \sum_{d=0}^n B_d(M_1, M_2) z^d.$$

The “perfect code” is a  $[[5, 1, 3]]$  stabilizer code.

- Its stabilizer and some logical operators are shown.
  - ▶ There are 16 stabilizers in total.
  - ▶ Each logical operator has 16 equivalent representations.

$$\mathcal{S} = \left\langle \begin{array}{l} XZZXI, \\ IXZZX, \\ XIXZZ, \\ ZXIXZ \end{array} \right\rangle$$

Owing to how we have selected to normalize:

$$A_{[[5,1,3]]}(z) = 4 \cdot (1 + 15z^4)$$

$$B_{[[5,1,3]]}(z) = 2 \cdot (1 + 30z^3 + 15z^4 + 18z^5).$$

$$X_L = XXXXX$$

$$Y_L = YYYYY$$

$$Z_L = ZZZZZ$$



## Two key results about quantum enumerators

### Theorem (Rains<sup>4</sup>)

Let  $U = U_1 \otimes \cdots \otimes U_n$  be a local unitary transformation. Then

$$A(w, z; UM_1U^\dagger, UM_2U^\dagger) = A(w, z; M_1, M_2),$$

and similarly for  $B$ .

### Theorem (Shor, Laflamme, Rains)

Let  $\mathcal{E}$  be an error basis on  $\mathfrak{H} = \mathbb{C}^q$  and  $M_1, M_2$  Hermitian operators on  $\mathfrak{H}^{\otimes n}$ . Then

$$B(w, z; M_1, M_2) = A\left(\frac{w+(q^2-1)z}{q}, \frac{w-z}{q}; M_1, M_2\right).$$

---

<sup>4</sup>Rains, *IEEE Trans. Inf. Theory* **44**(4), 1998.



# Enumerators characterize error detection

For a general  $[[n, k, d]]$  stabilizer code  $\mathfrak{C}$  we have

- $A_d(\Pi_{\mathfrak{C}}, \Pi_{\mathfrak{C}}) = 4^k \cdot \#(\mathcal{S}(\mathfrak{C}) \cap \mathcal{E}^n[d])$ .
- $B_d(\Pi_{\mathfrak{C}}, \Pi_{\mathfrak{C}}) = 2^k \cdot \#(\mathcal{N}(\mathfrak{C}) \cap \mathcal{E}^n[d])$ .
- Hence the distance  $d$  is the smallest nonzero power of  $\frac{1}{2^k}B(z; \Pi_{\mathfrak{C}}) - \frac{1}{4^k}A(z, \Pi_{\mathfrak{C}})$  with a nonzero coefficient.

Theorem (Ashikhmin, Barg, Knill, Litsyn<sup>5</sup>)

Let  $\mathfrak{C}$  be a  $[[n, k, d]]$ -code. Then the probability of an undetected error under a depolarization channel with error probability  $p$  is precisely

$$\frac{1}{2^k}B\left(1 - \frac{3p}{4}, \frac{p}{4}\right) - \frac{1}{4^k}A\left(1 - \frac{3p}{4}, \frac{p}{4}\right).$$

<sup>5</sup>Ashikhmin, Barg, Knill, Litsyn, *IEEE Trans. Inf. Theory* **46**(3), 2000.



# Tensor enumerators

We create “tensor enumerators” that are tensors with polynomial entries.

- A subset of legs  $J$  form the tensor indices (with basis elements  $e_{E,E'}$ ).
- The remaining legs are “traced” into enumerators.
- Here  $E \otimes_J F$  means insert factors of  $E$  into  $F$  at positions in  $J$ ,

## Definition.

Let  $\mathcal{E}$  be an error basis on  $\mathfrak{H}$ , and  $M_1, M_2$  be Hermitian operators. Then for any subset of legs  $J \subseteq \{1, \dots, n\}$  with  $|J| = m$ , we define:

$$\mathbf{A}^{(J)}(z; M_1, M_2) = \sum_{E, E' \in \mathcal{E}^m} \sum_{F \in \mathcal{E}^{n-m}} \text{Tr}((E \otimes_J F)^\dagger M_1) \text{Tr}((E' \otimes_J F) M_2) z^{\text{wt}(F)} e_{E, E'},$$

$$\mathbf{B}^{(J)}(z; M_1, M_2) = \sum_{E, E' \in \mathcal{E}^m} \sum_{F \in \mathcal{E}^{n-m}} \text{Tr}((E \otimes_J F)^\dagger M_1 (E' \otimes_J F) M_2) z^{\text{wt}(F)} e_{E, E'}.$$

# Properties of tensor enumerators

## Proposition

Let  $M_1, M_2$  and  $M'_1, M'_2$  be Hermitian operators on  $\mathfrak{H}$  and  $\mathfrak{H}'$  respectively. Let  $J$  and  $J'$  be set of legs on these. Then

$$\mathbf{A}^{(J \cup J')}(z; M_1 \otimes M'_1, M_2 \otimes M'_2) = \mathbf{A}^{(J)}(z; M_1, M_2) \otimes \mathbf{A}^{(J')}(z; M'_1, M'_2),$$

and similarly for  $\mathbf{B}$ .

## Theorem (Cao-L.)

Let  $\mathcal{E}$  be a unitary error basis on  $\mathbb{C}^q$ , Hermitian operators  $M_1, M_2$  on  $(\mathbb{C}^q)^{\otimes n}$ , and  $J \subseteq \{1, \dots, n\}$  with  $m = |J|$ , then with  $\Phi(e_{E,E'}) = \frac{1}{q^{2m}} \sum_{F,F' \in \mathcal{E}^m} \text{Tr}(F^\dagger E F' (E')^\dagger) e_{F,F'}$ .

$$\mathbf{B}^{(J)}(w, z; M_1, M_2) = \Phi \left[ \mathbf{A}^{(J)} \left( \frac{w+(q^2-1)z}{q}, \frac{w-z}{q}; M_1, M_2 \right) \right],$$



# Tracing tensor enumerators

The main result can be summarized by the following points.

- The network of the tensor enumerator is the same as that of the underlying code.
- The enumerator of the trace of two legs is the trace of the constituent enumerators (formally at left).
- Therefore, if the number of untraced legs does not grow too large we can exactly compute enumerators for quantum codes at scale.

## Theorem (Cao-L.)

Suppose  $j, k \in J \subseteq \{1, \dots, n\}$ , then

$$\begin{aligned} \wedge^{j,k} \mathbf{A}^{(J)}(z; M_1, M_2) \\ = \mathbf{A}^{(J \setminus \{j,k\})}(z; \wedge^{j,k} M_1, \wedge^{j,k} M_2), \end{aligned}$$

and similarly for  $\mathbf{B}^{(J)}$ .

Roughly speaking the complexity is exponential in the size largest cut encountered when tracing the network.



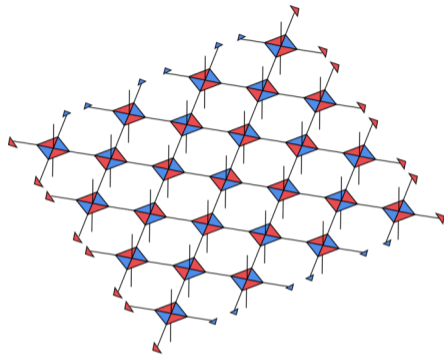
# Enumerators of surface codes

For the surface code, at left is a  $d = 4$  example.

The lego boundaries have been traced against stabilizer states (and so these are not the physical qubits of the code).

The logical qubits of the legos (downward pointing legs) are the physical qubits of the surface code.

The gauge qubits of the legos (upward pointing legs) are in aggregate the logical qubit.



Scaling up, the quantum weight enumerators of a  $[[181, 1, 10]]$  surface code are

$$A(z) = 1 + 36z^3 + 180z^4 + 136z^5 + 1344z^6 + 7084z^7 + 24001z^8 + 60432z^9 + 286748z^{10} + \dots$$

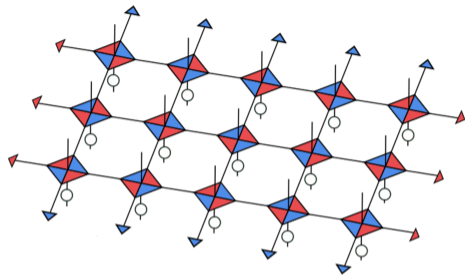
$$B(z) = 1 + 36z^3 + 180z^4 + 136z^5 + 1344z^6 + 7084z^7 + 24001z^8 + 60432z^9 + 286768z^{10} + \begin{matrix} \color{red}\blacksquare & \color{green}\blacksquare \\ \color{blue}\blacksquare & \color{yellow}\blacksquare \end{matrix}$$

# Enumerators of rotated surface codes

The rotated surface code uses the same quantum legos just assembled in slightly different way.

To the left we have an asymmetric  $3 \times 5$  code.

Similarly, the logical qubits (downward pointing) are the physical qubits of the surface code, while the gauge qubits (upward pointing) are in aggregate the logical qubit.



For a  $[[256, 1, 16]]$  rotated surface code a

$$A(z) = 1 + 30z^2 + 776z^4 + 15538z^6 + 276801z^8 + 4431408z^{10} + 65676619z^{12} \\ + 912021486z^{14} + 12003931907z^{16} + 150911390280z^{18} + \dots$$

$$B(z) = 1 + 30z^2 + 776z^4 + 15538z^6 + 276801z^8 + 4431408z^{10} + 65676619z^{12} \\ + 912021486z^{14} + 12004980483z^{16} + 150970896992z^{18} + \dots$$



# Enumerators of color codes

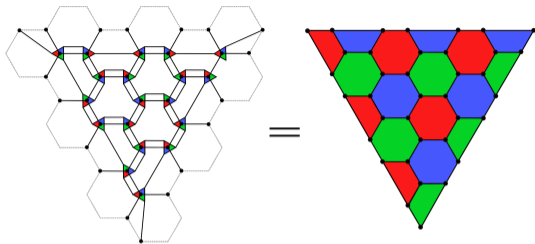
Here we see the construction of the  $d = 7$  color code (from the 6.6.6 family) built from Steane codes as legos.

Steane codes can be built from smaller legos, but are themselves small enough to be use as basic building blocks

The enumerators for a scaled up  $[[91, 1, 11]]$  code from this family are

$$A(z) = 1 + 54z^4 + 297z^6 + 2889z^8 + 24258z^{10} + 197493z^{12} + 1629738z^{14} \\ + 13287999z^{16} + 108647952z^{18} + \dots$$

$$B(z) = 1 + 54z^4 + 297z^6 + 2889z^8 + 24258z^{10} + 4176z^{11} + 197493z^{12} + 67242z^{13} \\ + 1629738z^{14} + 1066740z^{15} + 13287999z^{16} + 14401674z^{17} + 108647952z^{18} + \dots$$



# Thank You

## Questions:

- Can we find a simple lego constructions for quantum LDPC codes?
- Can we extend these constructions to analyze fault-tolerant circuits?
  - ▶ *Answer:* Yes! Stay tuned....
- Can use tensor enumerators to predict how to build good codes using legos?



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